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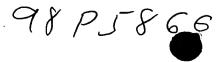
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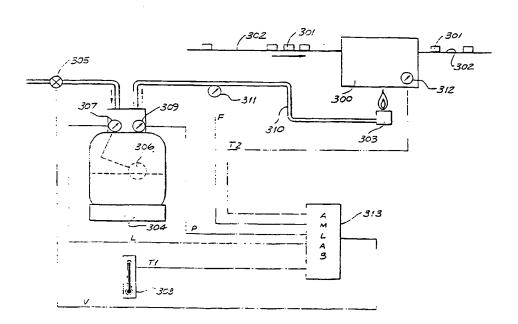
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(57) Abstract

The present invention discloses a measurement instrument incorporated in an IBM PC environment which is capable of interpreting the measurements made or sampled so as to provide a predictive or diagnostic conclusion. A classification procedure is carried out on all the measurements taken in a specific time period, an epoch, which can be as short as the measurement sample period. The classification procedure gives rise to the predictive or diagnostic capability. This procedure can also be used in a feedback control arrangement.

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INTERPRETIVE MEASUREMENT INSTRUMENT

The present invention relates to scientific instruments and, in particular, to an interpretive measurement instrument which enables various measurements to be taken and the results interpreted to provide a diagnostic or predictive conclusion.

BACKGROUND ART

In many fields of activity having a scientific basis, scientific instruments are used to analyse, record, and monitor the outputs of various devices. Such devices include strain gauges, electro-cardiograph 10 (ECG) devices, microphones, and pressure, temperature, flow rate and like transducers. Accordingly, such scientific instruments are used in civil engineering, electrical engineering, acoustics, hydraulic engineering, chemical processes, bio-medical engineering and so on.

A wide range of such scientific instruments are generally required 15 in order to undertake desired measurements. Such instruments include generators for various wave-forms (such as sine, square, ramp, and triangle); signal processing devices such as differentiators, integrators, filters, multipliers, and so on; analysers such as that required to carry out the Fast Fourier Transform, and various recording 20 devices such as a chart recorder, a data logger, a cathode ray oscilloscope or a transient recorder.

Alternatively, the desired measurements can be undertaken utilising a scientific instrument emulator as disclosed in the specification of PCT/AU 92/00076 assigned to the present applicant (but unpublished as of the priority date of the present application). The disclosure of that specification ultimately published under No. WO 92/15959 is hereby incorporated by cross-reference.

The present invention is concerned with the assessing or interpreting of the data which results from such measurements and, in the 30 described embodiments, discloses a means whereby various parameters measured in the course of taking the measurements, can be interpreted to provide a diagnostic or predictive conclusion.

SUMMARY OF THE INVENTION

In accordance with one aspect of the present invention there is 35 disclosed an interpretive measurement instrument comprising computer means including a memory means and at least two processors, an input analogue to digital conversion means having a plurality of analogue

signal inputs each with digitising means connected thereto and forming a corresponding digital output, signal routing means connected to said digital outputs to convey the data thereon to said memory means, and a classification program stored in said memory means and operable on said conveyed data to calculate an interpretive conclusion based on said conveyed data.

According to another aspect of the present invention there is disclosed a method of calculating an interpretive conclusion from a measured set of parameters using the above described interpretive 10 measurement instrument, said method comprising the steps of:-

- 1. forming a collection of previous measurement data each comprising a set of said parameters measured at a particular time,
- 2. allocating a result to each of said sets in said collection,
- creating a classification procedure using said collection and
 storing same in the instrument memory,
 - 4. measuring a further set of said parameters, and
 - 5. applying said classification procedure to said further set to generate said interpretive conclusion.

DESCRIPTION OF THE DRAWINGS

- Three embodiments of the present invention will now be described with reference to the drawings in which:
 - Fig. 1 duplicates Fig. 1 of the above mentioned PCT specification and illustrates a schematic block diagram of the hardware modifications required to an IBM PC.
- Fig. 2 duplicates Fig. 2 of the above mentioned PCT specification and is a block diagram of the analog module of Fig. 1.
 - Fig. 3 is similar to Fig. 6 of the above mentioned PCT specification and is a screen display listing the icons representing various instrumentation units.
- Fig. 4 is a block diagram of the circuit array used to both obtain and interpret the desired measurement data,
 - Fig. 5 shows a modification to the arrangement of Fig. 4 in order to cater for additional parameters to be measured,
- Fig. 6 is a block diagram similar to Fig. 4 but of a circuit array 35 of a second embodiment which uses the ID3 algorithm to classify numbers,
 - Fig. 7 is a reproduction of a screen display resulting from the use of the emulated circuit of Fig. 6.

Fig. 8 is a schematic arrangement of a feedback system using a neural network to maintain substantially constant the temperature of a kiln which receives articles for firing at irregular time intervals,

Fig. 9 is a block diagram similar to Figs. 4 and 6 but of an 5 emulated feedback circuit to control the kiln of Fig. 8, and

Fig. 10 is a schematic representation of the neural network represented by the icon NN of Fig. 9.

DETAILED DESCRIPTION

The first embodiment of the present invention will be described in 10 relation to the maintenance of electric motors, for example those used in electric trains. It is to be understood that the following example is illustrative of the principles of the invention only.

In conducting a, say, weekly maintenance check during a routine service, certain parameters of each motor are measured and recorded to 15 provide a set of parameters which indicate the state of the particular motor at the particular time. Hitherto these parameters have been interpreted by an expert skilled in the maintenance of electric motors who must determine whether or not certain parts should be replaced. The dilemma faced by the expert is essentially one of cost which must be 20 balanced against safety and/or inconvenience. If parts are replaced or repaired but do not need this action, the cost of maintaining the electric motors is unnecessarily high. If, however, parts that should have been replaced or repaired are not replaced or repaired and subsequently fail, then this failure will cause inconvenience, additional 25 expense, and possibly even an accident.

The set of parameters measured for each motor at each weekly service is as follows:

- 1. Peak Stator current during acceleration (SiMax)
- Peak Rotor current during acceleration (RiMax)
- 3. Peak audible noise in dB measured during acceleration (AMax)
 - 4. Average vibratition acceleration on motor chassis measured using an accelerometer (ChAvg)
 - 5. The change in parameter 1 since the motor was last replaced (SiAlt)
- The measurement is preferably carried out using the apparatus of the above mentioned PCT specification which, as illustrated in Fig. 1, is able to be totally enclosed within the case 1 of a conventional IBM

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(Registered Trade Mark) Personal Computer having an ISA or EISA bus based on the original IBM AT. Located within the case 1 are the usual components of a central processing unit (CPU) 2, memory 3 and 8MHz bus 4.

Located within a spare 5¹/₄ inch floppy disc nacelle is an analogue module 6 onto which are mounted dedicated input plugs 7, dedicated output plugs 8, and general input/output lines 5 for amplifiers, frequency counters, sample clock synchronising, digital inputs and the like.

Located on the bus 4 are four slots for printed circuit boards 9.

10 The four PC boards 9 are indicated A, B, C and D respectively. The three adjacent PCB's A to C inclusive are respectively a master PCB, a slave PCB and a video PCB. The video PCB in turn drives a known VGA printed circuit board D which can provide, for example, 1024 x 780 resolution in 256 colours. This PC board D is directly connected to the video display 15 screen 10.

Within the analogue module 6 are located the following system resources:

- l FOUR isolated (optional) analog i/p channels. Each channel has programmable 9-120dB gain (3 micro volts resolution @ signal to noise 20 ratio of one), programmable anti-alias filtering and an ADC conversion of 12 bit resolution. Each channel can be AC or DC coupled with long AC coupling time constants (2 minutes) and has independent controls of AC or DC offsets which can be controlled from the runtime screens. The sampling rate can be 15 KHz per channel (depending on the project 25 processing load) and the number of analog modules attached to the same slave processor card. The inputs are isolated to 3.5KV RMS continuous.
 - 2 TWO analog outputs with a voltage range of ± 10 Volts and a current capacity of ± 10 These can be used for strain gauge biasing (AC or DC driven), control outputs etc.
- 30 3 FOUR selectable high level analogue outputs, one from each of the amplifiers above. These drive digital FM tape recorders to store rarely occurring events for replay into the processor (2).

OR

FOUR selectable high level inputs to each of the amplifier 35 channels above. The system is switched into this mode for replay of events captured in output mode on tape.

4 EIGHT bits of ground referenced digital input.

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- 5 EIGHT bits of digital output which can be used for relay drivers or event indicators.
- 6 ONE frequency generator output (clock generator) 0-2 MHz 0.1% accuracy.
- 7 ONE event counter/frequency counter. Input 0.1Hz-8MHz.
 - 8 ONE 5 Volt reference 100mA +/- 5%. (For strain gauges etc.)
- 9 ONE sample clock output reference line for synchronising sampling between multiple scientific instrument emulators of the preferred embodiment.
- 10 ONE sample clock input reference line for synchronising sampling from a "master" scientific instrument emulator (for use with "slave" emulators), and
 - 11 FIVE ground wires.

The analogue module 6 and PC boards 9 are each interconnected by 15 means of different subsidiary buses 11, 12, 13 and 14 respectively.

As seen in Fig. 2, the analogue module 6 of Fig. 1 is provided with four analogue input/output connectors 20, four analogue inputs 21, two analogue outputs 22, a frequency output counter input 23, a clock output 24, an 8 bit digital input 25, an 8 bit digital output 26, a five volt 20 reference voltage 27 and a slave synchronizing output 28.

Each of the analogue inputs 21 is connected via a front end amplifier 31 to an isolator 32, the output of which is connected to a relay 33. The relay 33 is also connected to the analogue input/output connectors 20 and to an amplifier 34 which has programmable gain, AC/DC 25 coupling, provision for an AC corner and DC offset. The output of the amplifier 34 is in turn passed to a sample and hold circuit 35 the output of which is received by an analogue multiplexer 36. The output of the multiplexer 36 is passed via an A/D converter 37 to the subsidiary bus 11 which connects the analogue modules 6 and the PC board 9B.

The operation of the amplifiers 34 and the sample and hold circuits 35 is controlled by a digital controller, address decoder and A/D-D/A sequencer 39 which receives both data from the bus 11 and also sample clock and sequencer clock signals. The controller/decoder/sequencer 39 also outputs via D/A converters 40 to the analogue outputs 22 via an 35 output amplifier 41.

The frequency counter input 23 and clock output 24 respectively directly communicate with a counter 42 which again communicates directly with the subsidiary bus 11.

Each of the digital inputs 25, digital outputs 26, reference voltage 27 and slave synchronizing output 28 is connected to a digital input/output circuit 43 which is in turn directly connected to the subsidiary bus 11.

The timing arrangements of the circuit illustrated in Fig. 2 are divided into two sequences. The first sequence concerns the digital input and output. When required by the program, this digital input and output is effected by individual commands from a substantially conventional data acquisition controller which forms part of the slave 10 processor on PCB 9B (Fig. 1).

The second sequence is the flow of digital data converted from the analogue inputs, or to be converted to provide the analog outputs. This digital data is received and despatched under the control of the controller/decoder/sequencer 39 which can be preset to operate the 15 required number of incoming and outgoing analogue channels. The controller/decoder/sequencer 39 performs one complete cycle of inputting and outputting, or sequence, every sample period and does so with minimal processor involvement, thus increasing the speed of operation of the data acquisition controller referred to above on the slave processor of PCB 9B.

Other functions of the circuit of Fig. 2, such as the frequency to be output as the clock output 24, the "range" of the frequency to be counted by the frequency counter input 23, and any synchronisation signal required for the slave synchronising signal 28, are set up at the start of the execution of the graphical compiler program by appropriately 25 specifying the corresponding icon.

Utilising the various icons indicated in Fig. 3, an array as illustrated in Fig. 4 is created in accordance with the principles described in the above mentioned PCT specification. Once the array has been interconnected to the satisfaction both of the operator and the 30 set-up program used during this phase, a compiler program is then run which compiles from the graphical representation of the array the executable object code which executes the overall signal processing function for the entire array. As a consequence, when, in real time, the input signal is applied to the array, the incoming signal(s) is/are 35 manipulated and the one or more outputs of the array are indicated in real time on the video windows able to be displayed on the screen 10, stored to disc, and so on.

It will be apparent to those skilled in the electronic arts that the above described array emulates an electric circuit having four inputs each connected via a corresponding one of four isolating amplifiers 101A-101D. These correspond to the first four parameters referred to above to be measured. An acceleration switch 102 is provided to trigger the measurement of stator current, rotor current and audible noise. In order to provide peak measurements, a latching arrangement, in the form of a sample and hold circuit 103 and logic gate 104, is provided for each of these outputs. The peak output is then passed to a corresponding input of a multiplexer 105. The output of the accelerometer is averaged utilising a low pass filter formed from an integrater 106 placed in a feed back loop. Again the output is passed to the multiplexer 105.

The multiplexer 105 is triggered from the square wave voltage controlled oscillator 107 to form a vector at the end of the epoch. Thus 15 the period of the output of oscillator 107 determines the length of the epoch. When the trigger occurs, the values on each of the five inputs to the multiplexer 105 are clocked through on the next occurring sequential five sample periods. The trigger is delayed by the same five clock periods.

The data on the various lines can be regarded as forming a data vector. In the initial release of the machine described in the above mentioned patent application, the data vector is formed from the data available on the first line at a first sample time, the data available on the second data line at a second sample period, and so on. This accounts 25 for the above described delayed triggering arrangements.

However, in a later release of the machine having an improved speed performance, it is possible for the data on all, say, five inputs or lines to be simultaneously clocked through. Thus under these circumstances the data vector constitutes all the data available at each 30 sample period. It is therefore possible to carry out a classification for each sample period rather than each sequence of sample periods.

As indicated in Fig. 5, if additional parameters are required, then one or more further multiplexers 105A, etc can be provided in a cascade connection. Here, the value on the topmost input of multiplexer 105A is 35 directed straight through to the output of the multiplexer 105A. This arrangement allows the multiplexers 105 and 105A to be cascaded to form a data stream with values of the different parameters clocked through on successive sample periods.

As seen in Fig. 4, the multiplexer 105 inputs to an ID3 icon 108. This is able to be set into two different modes. In the first mode data is collected and in the second mode a decision tree algorithm created by the ID3 algorithm is run.

With the ID3 icon 108 set into the data collection mode, the results of tests conducted at various dates for various motors can be collected. The results are illustrated in the following table.

TABLE 1

10							
	Test	SiMax	RiMax	AMax .	ChAvg	SiAlt	Classification
	DD/MM/YY,#n	Amps	Amps	dB	m/sec ²	Amps	
15	27/01/92,#1	120	25	100	23	-	No Failure
	27/01/92,#2	111	26	110	10	-	No Failure
20	28/01/92,#3	130	30	105	30	10	Rotor Jammed
40	etc						

The first column in Table 1 is simply the date of the test and the 25 number of the motor tested. The next five columns are the results of the five parameters and the final column is a classification which indicates the historical outcome. Typical classifications for this column are as follows:

- 1. Replace entire Motor
- 2. Rewind Stator
 - 3. Replace Rotor
 - 4. Do nothing.

This classification can be arrived at in either one of three ways. Firstly, the action of the above mentioned expert and the instructions he issued on the basis of the measured parameters could be used as the basis for the classification. This will generate a decision tree or other classification procedure (to be explained hereafter) that will replicate

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the experience of this expert. This method has the advantage that it does not require any procedural changes to allow data to be collected. A major disadvantage, however, is that the result derived from the data will never be any better than the human expert.

- Alternatively, the historical outcome of the maintenance carried out during the previous week could be used to determine the classification. If a certain part of the motor fails during normal operation, then the type of failure is attributed as the classification of the data collected for that particular motor on the previous

 10 maintenance measurement. This has the advantage of allowing the decision tree procedure to account for any mistakes made by the expert. It has a definite disadvantage, however, in that it is preferable for no maintenance to be carried out on the motors during the period between measurements. If a motor is repaired, then the number of examples of

 15 failures associated with a particular measured parameter, may be missed as it is unknown as to whether or not the suspect part would have failed. Not repairing the motors, however, could cause safety problems. The types of classifications generated with this alternative method can
- 20 1. Motor burnt out

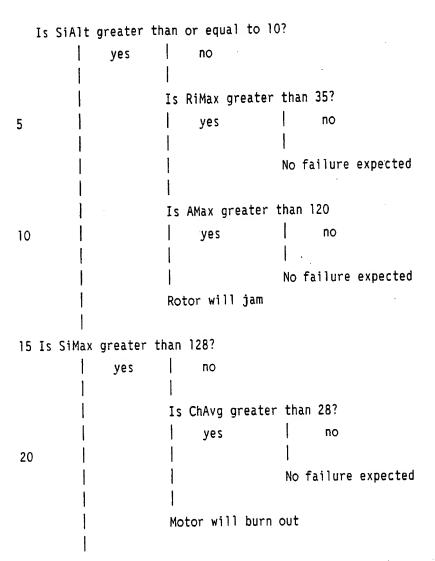
be as follows:

- 2. Rotor jammed
- 3. Stator insulation failed
- 4. No failures.

A third classification method is to use both the methods outlined 25 above. Effectively this adds a correction to the expert's classifications due to known outcomes.

Irrespective of the classification method used, a collection of historical results and the corresponding classifications as indicated in Table 1 above, is available.

A decision tree procedure is then applied to the historical results in order to build a decision tree. A typical resulting decision tree is as follows:



25 Motor will burn out.

Once the decision tree has been produced, this is then stored in implementable form in the computer memory. It is then possible to switch the ID3 icon 108 into the second of its two modes. Under these 30 circumstances, when a set of measurements is next undertaken for a particular motor, the measured values are conveyed via the multiplexer 105 to the ID3 icon 108. The ID3 icon 108 then applies the decision tree to the resulting data and arrives at a result, such as "no failure will occur", or "the rotor will jam", which is predictive of the expected 35 outcome based upon the historical accumulation of knowledge which is expressed in the decision tree. Based upon the result obtained from applying the decision tree to historical data not used in building the

tree, a confidence level can be calculated or ascribed to a particular outcome. This enables an insurance company to have a numerical basis by means of which the risk of plant failure can be determined. This results in the potential for lower insurance premiums.

The ID3 icon 108 is realised in terms of software since it would be inpractically expensive to purchase, and interconnect, hardware gates which duplicated this program function. Set out in Annexure I to this specification is an outline of the entropy calculation used for selecting decisions in the decision tree building program. The ID3 algorithm is 10 itself known per se from Quinlan Jr. INDUCTION OF DECISION TREES.

Machine Learning 1(1) pp81-106, 1986.

The ID3 algorithm is based on the well publicised algorithm for calculating the entropy, or disorder, H within a system with two outcomes and "n" classifications:

15

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where

$$25 \text{ W}_1 = \text{N}_1/(\text{N}_1 + \text{N}_2)$$
 and $\text{W}_2 = \text{N}_2/(\text{N}_1 + \text{N}_2)$

 N_1 = number of examples in outcome 1

30 N_2 = number of examples in outcome 2

n = number of classes

 $P_1(i)$ = number of examples in class i with outcome 1 divided by the total number of examples in class i

 $P_2(i)$ is as for $P_1(i)$ but for outcome 2 rather than outcome 1

This calculation is known to work well in noisy environments. The tree building procedure uses the above formula to trial numerous possible decisions. The decision which decreases the entropy to the greatest extent is chosen. The examples are then divided on this decision and two new decisions are then found to further break the example sets down. This process is continued until either an entropy of zero is reached or no decision can be found that will result in a further reduction in entropy.

Set out in Annexure II to this specification is a program listing 10 which is illustrative of the procedures carried out when the ID3 icon is switched to its decision tree run mode.

Included within the disclosure of the present application is the use of the C4 procedure (known per se) to prune or otherwise refine the decision tree created utilising the ID3 procedure.

It will be apparent that the above described arrangement provides an enormous benefit. This is that the one device is used both to collect the data used to derive the decision making tree, and to collect the data on the basis of which the interpretive decision is to be made. As a consequence, all systemic sources of error are eliminated since both 20 types of data are collected in the same environment.

Therefore a prior problem which had always existed: namely the problem of possible, and indeed probable, conditioning of the historical data of the example set, not being the same as the conditioning of the data of the measurement, is overcome. Such conditioning of data can 25 arise as a result of various mechanisms such as filtering, timing, sampling, triggering and so on.

Indeed, not only is a discrepancy between the historical data and the actual measurement data avoided by using the same machine (the scientific instrument emulator) to collect the data and to conduct the 30 measurement, but also any variations of the above type amongst the historical data set itself are also eliminated.

This uniformity of data capture and measurement is guaranteed because the array can stored within the machine memory and thus the array itself, the settings of any icons requiring settings, and like

35 information is able to be stored in the same memory record as the data itself. The preferred mechanism for this data storage is for the program to specify new entries in prior art data bases known per se such as VBX,

OLE, dBase, Paradox and Retrieve (Trade Marks). This can be done "in background" without requiring any specific action by the user. As a consequence any difference between measurements take on one occasion and measurements taken on another occasion can be eliminated.

- Further, the implementation of the interpretative measurement can be regarded as involving two or more of the following phases:
 - (A) acquisition of example data at one or more earlier time periods termed "epochs",
- (B) the application of the classification system to build up the 10 "expertise" inherent in the classification procedure which is ultimately derived from the historical data, and
 - (C) the taking of a predictive measurement by applying the classification procedure in real time to data being acquired in the source of the measurement procedure.
- Because phases A and C above take place in the same circuit array and thus have the same connectivity and operate in a repeatable fashion, the above described advantage of elimination of systemic error from both the historical data and the current measurement is able to be achieved.

Furthermore, another advantage is also able to be achieved. This
20 is that each measurement taken can be used to add a further data result
to the existing set of historical data. This means that use of the
machine to make predictive or interpretive measurements is able to add to
the experience of the machine. Such processing activities can be
performed on either currently measured or previously stored data and
25 interpretations provided in real time (i.e. before the next epoch).
Such a process is essential to machine learning. The machine

architecture as described enables this process to be carried out.

Similarly, the classification expertise within the machine is available for application or modification whilst a new measurement is 30 being undertaken and data recorded and without interrupting that data acquisition. In the first instance the classification system is applied to the newly collected data. This is phase C in operation. However, the newly acquired data can also be used to modify the existing classification procedure based on the addition data measured and from 35 that time the modified classification procedure can be used. This use can be either in respect of new data (phase C) or in respect of the latest data used to modify the classification procedure (phases B and C in sequence).

Referring now to the second embodiment to be described in relation to Fig. 6 and 7, this embodiment relates to a circuit to classify numbers into four classes based upon the magnitude of the number. If the number has a magnitude only of units, then it is classified in class 1, if the magnitude is in the tens, then it is classified as class 2, if the magnitude is in the range of hundreds, then it is classified as class 3 and finally if the magnitude is in the range of thousands then it is classified as class 4. Clearly the range of numbers is limited to four digit numbers in this embodiment.

The classifying circuit 200 is emulated by the array or block diagram illustrated in Fig. 6. The numbers themselves are generated by means of four white noise generators 201 which each consist of a pseudo random number generator the output of which is coupled to a limiter 202 in the case of the digits representing thousands, hundreds and tens.

15 Since each of the white noise generators 201 has a mean value of zero averaged over a long period of time, the white noise generator 201 for the units is connected to an offsetting voltage generator 203 to give a value which is centred about the magnitude 5.

The output from each of the number generators is passed in two 20 directions. In the first "horizontal" direction the output is passed through a sample and hold circuit 205 and thence to a numeric display 206. The four numeric displays 206 have an output which is indicated in Fig. 7 as A, B, C and D respectively with the display A representing the thousands and the display D representing the units.

The outputs from the sample and holds circuits 205 are also connected as inputs to a multiplexer 207 the output of which is operated upon by the ID3 classifier 208. The result of the ID3 classification is both displayed in a numeric display 209 (labelled "ID3class" in Fig. 7). In addition, the output of the ID3 classifier 208 is also displayed by 30 means of a visual display 210 which constitutes the graphical output of Fig. 7.

Appearing above the white noise generators 201 in Fig. 6 is a timing and counting circuit which determines the rate at which measurements are taken and also determines the epoch or period of time 35 over which the accumulation of parameters occurs. Essentially this circuit comprises a variable frequency square wave generator 212, a triggering circuit 213 and a counter 214. The output of the counter 214

is used as a triggering signal throughout the circuit in order to ensure synchronism. The maximum count permitted by the counter 214 is able to be determined via a check box input 215. This determines the length of the epoch which can vary in different applications between one sample and a large number of samples. Such an input enables non-acquired data to be entered in order to be utilised in the classification procedure. Such non-acquired or non-measured data can include a patient's age, gender, skin colour, geographic residence, nominal voltage, nominal frequency of a mains supply voltage, type of machine, age of machine, lubrication 10 grade, and the like.

The output from the number generator is also passed "vertically" into a logic network 218 which by means of various logic gates calculates a control or check classification against which the classification generated by the ID3 classifier 208 can be compared. The result of the 15 classification calculated by the logic network 218 appears at the numeric display 219. This control result appears in the box headed "ID3class" in Fig. 7.

The classification as determined by the logic network 218 and the classification as determined by the ID3 classifier 208 are each input 20 into a comparator circuit 220 in order to enable an error to be calculated and displayed in numerical display 221. This display appears under the heading "Errors" in Fig. 7. In addition, by means of a counter 222, a total number of examples is able to be displayed in numeric display 223 and a percentage error is also able to be counted and 25 displayed in numeric display 224.

The results of operation of the circuit of Fig. 6 are illustrated in Fig. 7. The graph represents the output of the visual display 210 which appears as the level 3 given at the left hand side of the trace of the graph of Fig. 7. The four consecutive previous samples produce the 30 results of 1, 3, 0 and 2 respectively.

The information for the current sample is given in the boxes immediately below the graph or trace. The sample is number 136 of a sequence of samples and the number generated for that particular sample by the white noise generators 201 has the numerical value 205. It is correctly classified by the ID3 classifier 208 as being in class 3 (i.e. hundreds) and this is as indicated in Fig. 7. However, the ID3 classifier 208 is not completely error free and it will be seen in the

number of 136 samples or examples to date there have been five errors detected by the logic network 218 which gives a percentage error rate of 3.67.

Turning now to Figs. 8 to 10, a third embodiment of the present invention, in this instance incorporating a neural network rather than an ID3 decision tree will now be described. Here the classification procedure is used in a feedback network which is utilised to maintain essentially constant the temperature of a kiln 300 which receives for firing articles 301 which are transported into and out of the kiln 300 by 10 means of a conveyor 302. Since the articles 301 are not regularly spaced on the conveyor 302, the heat demand of the kiln, and hence the kiln temperature, varies according to the spacing of the articles 301 on the conveyor 302.

The kiln 300 has a gas fired burner 303 which is supplied by gas 15 from a gas supply bottle 304 which is in turn replenished from a gas supply (not illustrated) by means of an inlet valve 305 which is either open or closed. The inlet valve 305 is typically a solenoid operated valve.

The gas bottle 304 is supplied with a float arm 306 (illustrated in 20 phantom) which operates a level indicator 307 which indicates the level L of liquefied gas within the gas bottle 304. This level L is to some extent dependent upon ambient temperature T1 which is indicated by a temperature sensor 308. The gas bottle is also provided with a pressure sensor 309 to indicate the pressure P. The pipe 310 which interconnects the gas bottle 304 and gas burner 303 includes a flow transducer 311 which measures the rate of flow F of gas to the burner 303. The kiln 300 is also provided with a temperature sensor 312 so as to provide a signal which is indicative of the temperature T2 of the kiln 300. The outputs of the various sensors and transducers are connected to the AMLAB (Registered Trade Mark) interpretive measurement instrument 313 which is used to both sense and control the electrical signal V which determines whether the inlet valve 305 is open or closed.

Turning now to Fig. 9, a circuit emulation which produces the desired feedback results is illustrated in which an isolating amplifier 35 315 is connected to each of the transducers 307, 308, 309, 311 and 312. A voltage reference source 316 is used to determine the temperature to which the kiln temperature is to be controlled. This voltage reference

is subtracted from the output of the temperature sensor 312 in order to provide a control signal as to whether the temperature of the kiln 300 should be increased or decreased. The various electrical inputs are connected to a multiplexer 317, the output of which is connected to a neural network icon 318. The output of the neural network icon 318 is passed via a logic gate 319 to an input to the multiplexer 317. This signal completes the feedback path and is also digitised by means of quantizer 320 in order to provide an on-off signal to the inlet valve 305.

The neural network represented by the neural network icon 318 is schematically illustrated in Fig. 10 as a three layer perceptron, the representation being adapted from Hinton and Sejnowski (1987). The inputs to the neural network respectively consist of the kiln temperature T2 (or the difference between that temperature and its desired control figure), the flow rate F of the gas in the pipe 310 leading to the gas burner 303, the gas pressure P within the gas bottle 304, the level L of liquefied gas within the gas bottle 304, the ambient temperature T1, and whether the inlet valve 305 is open. Each of these signals is weighted in accordance with a predetermined weighting W and the output of the neural network is a signal indicating whether the inlet valve 305 should be opened or closed.

It will be apparent from the above description of the three embodiments that there are three circumstances in which the classification procedure is able to be applied. The first such 25 circumstance is where it is possible to only have one outcome over a whole range of input data. For example, whether the train motor is to be replaced in accordance with the particular measurements taken of the motor characteristics. Under these circumstances, there is only one outcome and there is also only one data sample for each session.

In the second circumstance there is a set of conditions which initiates a sampling that extends over a certain time period. This gives rise to there being a single classification or example for each event. Examples include that the monitoring, say, every fifteen seconds of a continuous flow and deciding as a result of the monitoring if there is a 35 flow or a blockage. A further example might include detecting whether a pump was still working and the presence or absence of cavitation in the liquid being pumped. If cavitation were detected then the pump power

would be reduced. A further example of this circumstance is the number magnitude detection carried out in the second embodiment.

The third type of circumstance is where a classification in accordance with the classification procedure is made in every sample period. In particular, this enables the classification procedure to be used in a control loop and the third embodiment exemplifies this circumstance.

Although detailed embodiments of an ID3 classification procedure and a neural network classification procedure have been given, the 10 present invention is equally applicable to other types of classification procedures which incorporate fuzzy logic, rule based expert systems, or logistic regression. All of these types of classification procedure are applicable in the continuous data stream environment in which the data collection, classification and interpretive measurement are carried out.

- The above described embodiments exemplify two features of the present invention which substantially enhance its effectiveness as an interpretive instrument. These are as follows:
 - Data of different types can be captured simultaneously. The data can be as diverse as colour, image amplitude, acidity (pH) or
- 20 temperature. This can be easily achieved since all sensor inputs are sampled simultaneously in a tightly coupled hardware architecture which involves no communication delays which would otherwise stagger the commencement and termination of epochs. Similarly, the display abilities of the instrument are such that synchronous data is displayed at high
- 25 refresh rates for synchronous epoch periods for selected sample sets. The selection of a sample set can be made at the commencement of the measurements taken to create the sample set.
- 2. There are two processing regimes which determine the final output and are completed within a known and repeatable time period irrespective 30 of the combination of input states. The first of these operates at the basic sample rate and enables the signal processing to be carried out. The second operates at the epoch rate, for example to run the classification procedure. In iterative control systems or diagnostic systems incorporating the interpretive measurement instrument, the 35 classification procedure should occur sufficiently frequently for system stability. The epoch rate is normally slower than the sample rate. However, the epoch rate and the sample rate can be the same. This

applies especially with increasing example sets as occur in "machine learning" situations.

Such an interpretive instrument is inherently expandable in its capabilites and a multiprocess or architecture as described is ideally suited for this since it is operable within an IBM PC environment, which is now the world's most widely used computing machine.

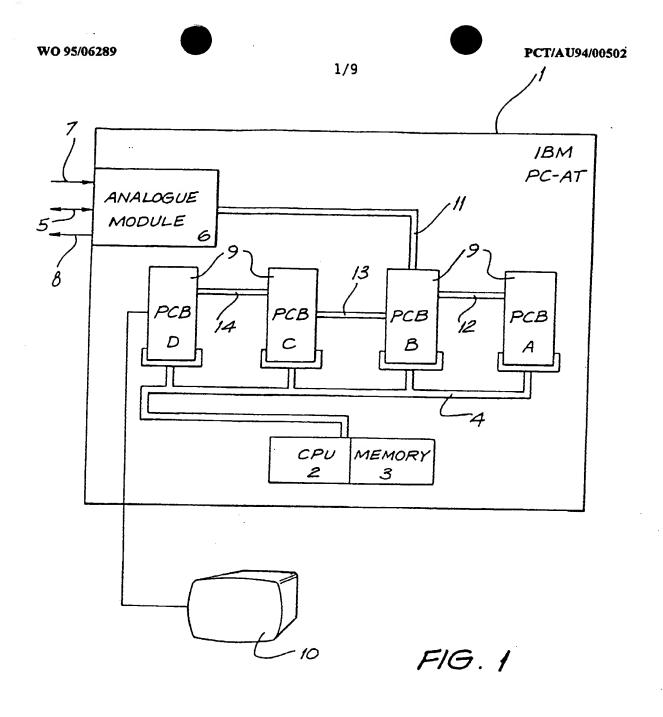
The foregoing describes only some embodiments of the present invention and modifications, obvious to those skilled in the art, can be made thereto without departing from the scope of the present invention.

CLAIMS

- 1. An interpretive measurement instrument comprising computer means including a memory means and at least two processors, an input analogue to digital conversion means having a plurality of analogue signal inputs each with digitising means connected thereto and forming a corresponding digital output, signal routing means connected to said digital outputs to convey the data thereon to said memory means, and a classification program stored in said memory means and operable on said conveyed data to calculate an interpretive conclusion based on said conveyed data.
- 2. An instrument as claimed in claim I wherein the classification program utilizes historical data stored in said memory and entered therein via said analogue signal inputs and signal routing means, and the same signal conditioning is utilized for data on which an interpretive measurement is to be performed, thereby substantially eliminating data conditioning errors.
- 3. An instrument as claimed in claim 2 wherein said memory means receives said conveyed data and supplements said historical data with same to thereby increase said historical data with each measurement taken.
- 4. An instrument as claimed in claim 3 wherein said classification program is modified by the cumulative historical data stored in said memory means.
- 5. An instrument as claimed in claim 3 or 4 wherein said memory means is divided into epoch portions and said conveyed data is allocated into different epoch portions of said memory means based upon the time or times during which said conveyed data was generated.
- 6. An instrument as claimed in any one of claims 1-5 wherein said signal routing means comprises a multiplexer means to form a data vector having data values formed from data digitised by said digitising means on sequential samples.
- 7. An instrument as claimed in any one of claims 1-5 wherein said signal routing means comprises a multiplexer means to form a data vector having data values formed from data digitised by said digitising means on simultaneous samples.
- 8. An instrument as claimed in any one of claims 1-7 wherein said signal routing means includes non-measured data input means whereby data conveyed to said memory includes data not input via said analogue signal inputs.

- 9. An instrument as claimed in any one of claims 1-8 wherein said classification program is embedded in a feedback and/or control loop.
- 10. An instrument as claimed in any one of claims 1-8 wherein said classification program is selected from the group consisting of ID3 decision trees and neural networks.
- 11. An instrument as claimed in any one of claims 1-9 wherein said classification program incorporates logic selected from the group consisting of fuzzy logic, rule based expert systems and logistic regression.
- 12. An interpretive measuring instrument as claimed in any one of claims 1-12 and comprising the scientific instrument emulator as claimed in PCT/AU 92/00076.
- 13. A method of calculating an interpretative conclusion from a measured set of parameters using an interpretive measurement instrument as defined in claim 1, said method comprising the steps of:-
- forming a collection of previous measurement data each comprising a set of said parameters measured at a particular time,
- allocating a result to each of said sets in said collection,
- 3. creating a classification procedure using said collection and storing same in the instrument memory,
- 4. measuring a further set of said parameters, and
- 5. applying said classification procedure to said further set to generate said interpretive conclusion.
- 14. A method as claimed in claim 13 wherein steps 1 and 5 are carried out on the same interpretive measuring instrument, thereby substantially eliminating data conditioning errors.
- 15. A method as claimed in claim 14 wherein the further set of parameters measured in step 4 is added to the collection of previous measurement data formed in step 1.
 - 16. .A method as claimed in claim 15 including the steps of:
- 6. modifying said classification procedure using said augmented collection, the modified classification procedure being stored in the instrument memory, and
- 7. at a later time applying the modified classification procedure to said further set to generate a modified interpretive conclusion.

- 17. A method as claimed in any one of claims 13-16 wherein said collection of previous measurement data is divided into epoch portions based upon the time or times during which said previous measurement data was collected.
- 18. A method as claimed in any one of claims 13-17 including the step of inputting non-measured data into said sets or further set of parameters.
- 19. A method as claimed in any one of claims 13-18 wherein each said set of parameters comprises a data vector having data values formed from sequential or simultaneous samples.
- 20. A method as claimed in any one of claims 13-19 wherein said classification procedures utilizes logic selected from the group consisting of ID3 decision trees, neural networks, fuzzy logic, rule based expert systems and logistic regression.



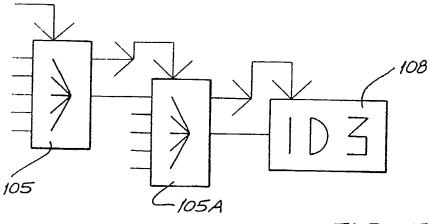
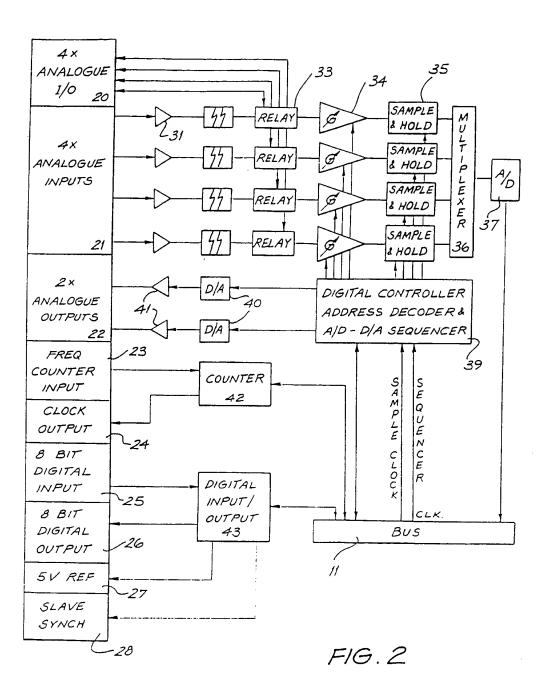
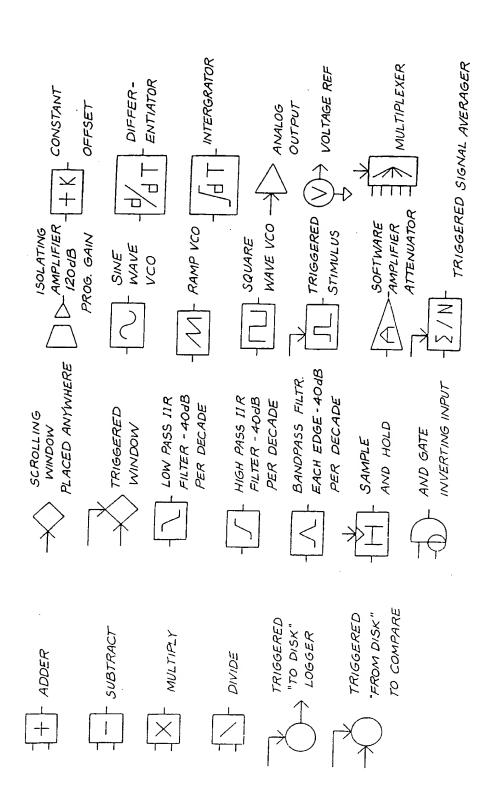


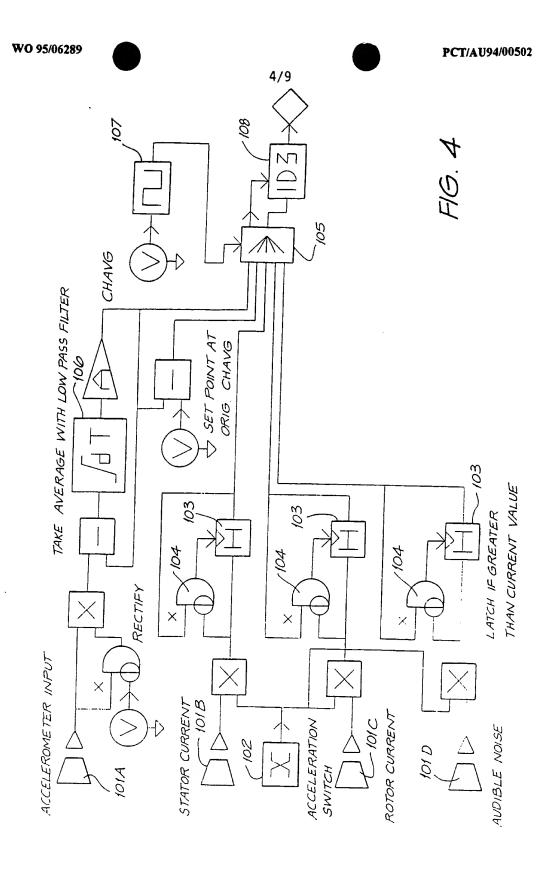
FIG. 5

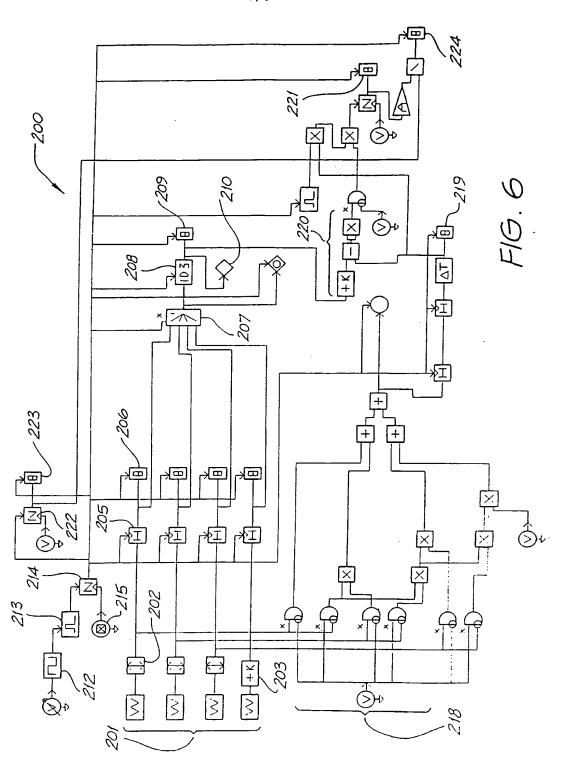
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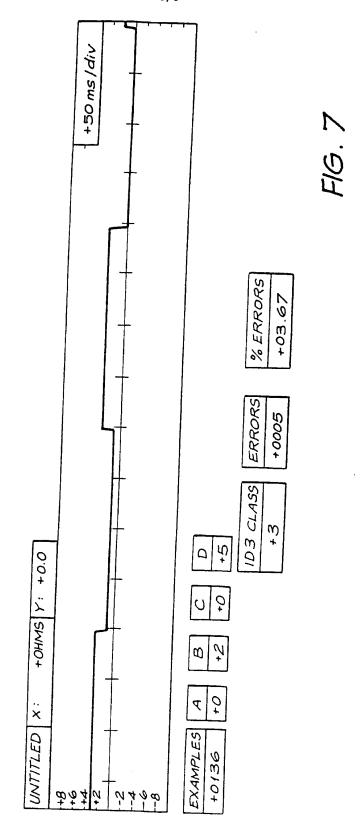


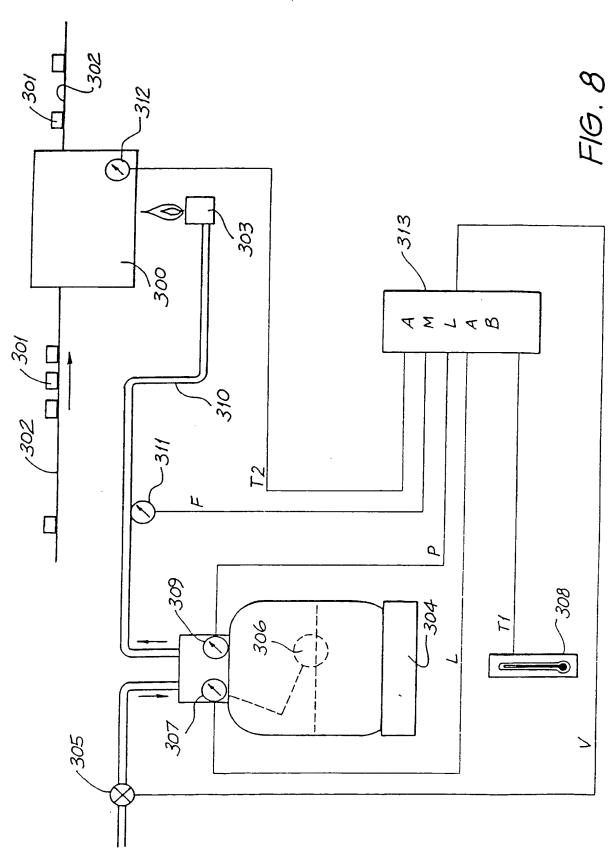
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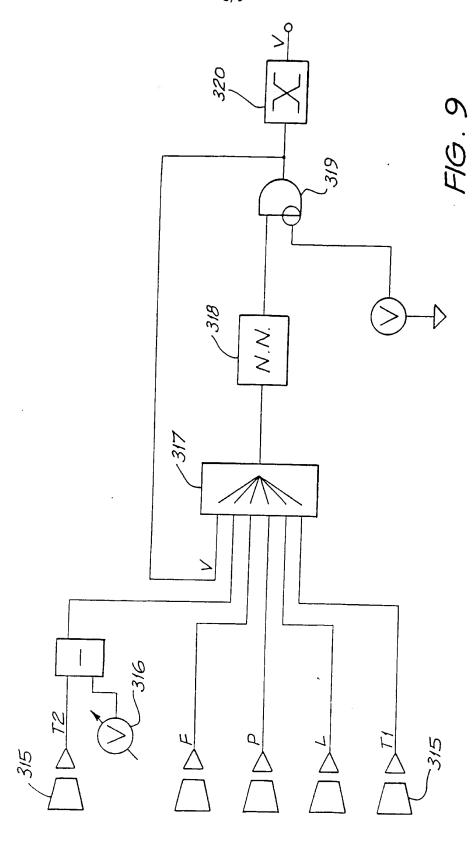


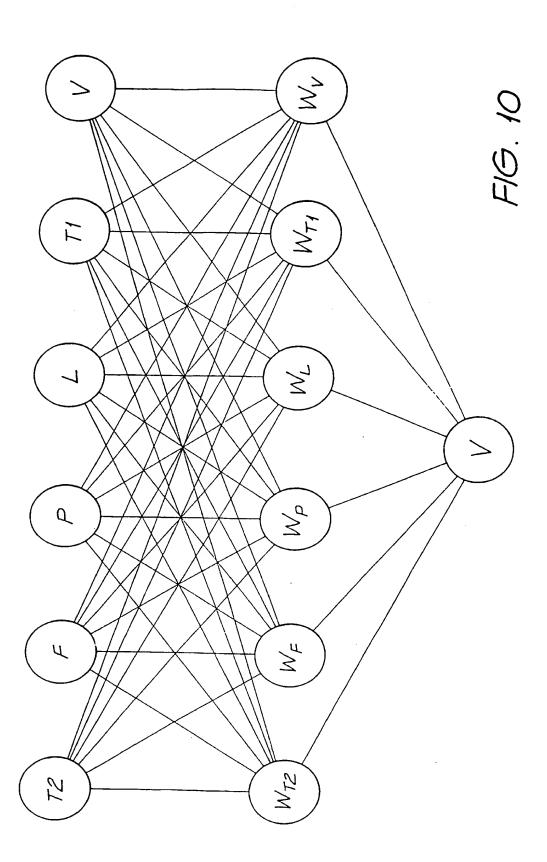














A. CLASSIFICATION OF SUBJECT MATTER Int. Cl. 6 G06F 15/18

According to International Patent Classification (IPC) or to both national classification and IPC

B. FIELDS SEARCHED

Minimum documentation searched (classification system followed by classification symbols) IPC G06F 15/18, 15/46, 15/74

Documentation searched other than minimum documentation to the extent that such documents are included in the fields searched AU: IPC as above

Electronic data base consulted during the international search (name of data base, and where practicable, search terms used) CD ROM: US CLASSES 340, 364 & KEYWORDS

C. DOCUMENTS CONSIDERED TO BE RELEVANT

Category*	Citation of document, with indication, where appropriate, of the relevant passages	Relevant to Claim No.		
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X,P	WO,A, 94/11821 (SIEMENS AG) 26 May 1994 (26.05.94) See whole document	1,9		
Y	US,A, 5140523 (FRANKEL et al) 18 August 1992 (18.08.92) See whole document	1-4,8-11		
Y	US,A, 5133046 (KAPLAN) 21 July 1992 (21.07.92) See whole document	1,3,4,9		

X Further documents are listed in the continuation of Box C.	See patent family annex.
* Special categories of cited documents : "T"	later document published after the international
"A" document defining the general state of the art which is not considered to be of particular relevance earlier document but published on or after the international filing date document which may throw doubts on priority claim(s) or which is cited to establish the publication date of another citation or other special reason (as specified) document referring to an oral disclosure, use, exhibition or other means document published prior to the international filing date but later than the priority date claimed "%"	filing date or priority date and not in conflict with the application but cited to understand the principle or theory underlying the invention document of particular relevance; the claimed invention cannot be considered novel or cannot be considered to involve an inventive step when the document is taken alone document of particular relevance; the claimed invention cannot be considered to involve an inventive step when the document is combined with one or more other such documents, such combination being obvious to a person skilled in the art document member of the same patent family
	f the international search report 1994 (8.12.94)

Date of the actual completion of the international search 5 December 1994 (05.12.94)	Date of mailing of the international search report 8 Dec 1994 (8.12.94)
Name and mailing address of the ISA/AU AUSTRALIAN INDUSTRIAL PROPERTY ORGANISATION	Authorized officer
PO BOX 200 WODEN ACT 2606 AUSTRALIA	JOHN THOMSON
Facsimile No. 06 2853929 Telephone No. (06) 2832214	



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Y	US,A, 4730259 (GALLANT) 8 March 1988 (08.03.88) See col 1 lines 1-33, col 2 line 33 - col 3 line 2, Figs 1-5	1,3,4,8,9
Y	US,A, 4707796 (CALABRO et al) 17 November 1987 (17.11.87) See col 2 line 40 - col 3 line 5, Fig 2	1,2,8,9
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US	5133046	NON	E					
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US	4707796	NON	E					
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